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## Screening the ESA ATSR-2 World Fire Atlas (1997–2002)

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**Abstract.** We screened the algorithm 2 (308 K threshold) European Space Agency (ESA) World Fire Atlas (WFA), for the period 1997–2002, using ancillary land cover, night-lights and volcanic activity datasets, combined with statistical techniques to detect the occurrence of space-time clusters of anomalous observations. The WFA is built using night time data from the Along Track Scanning Radiometer (ATSR) onboard the Second European Remote-Sensing Satellite (ERS-2). The spatial resolution of the data is 1 km and the satellite revisiting period is 3 days at the equator. The WFA is the first and longest archive of global fire observations and has been used in numerous biomass burning studies. Known limitations of the WFA are the inclusion of warm surfaces, gas flares, and city lights, and an underestimation of actual global fire activity, due to the time of satellite overpass. Nevertheless, it has been considered that the WFA contains a relatively small proportion of observations that do not correspond to vegetation fires, which is not corroborated by our findings. During the study period, the annual percentage of false alarms and non-vegetation fires varied from a minimum value of 20.6% in 1997 to a maximum of 27.9% in 1998. Gas flares and hot bare soils are the major sources of false alarms and non-vegetation fires.

### 1 Introduction

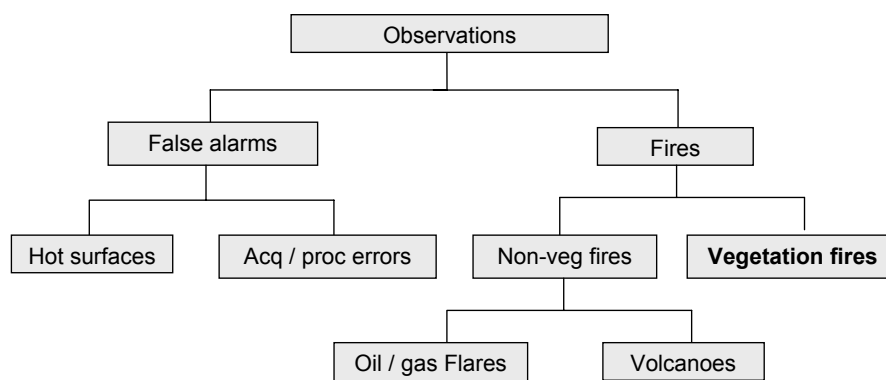
Vegetation fires play an important environmental role over large areas of the Earth surface, influencing ecosystem productivity (Houghton, 2003; Potter et al., 2003), vegetation distributions patterns (Bachelet et al., 2001), and climate (Oglesby et al., 1999; Menon et al., 2002). Fires also represent a significant source of aerosols and trace gas emis-

sions (Bey et al., 2001; Kinne et al., 2003; Langenfelds et al., 2002). Recent analyses based on data from the Global Burned Area 2000 (GBA2000) project (Grégoire et al., 2003) estimate that 3.5 million km<sup>2</sup> burned globally during the year 2000 (Tansey et al., 2003), corresponding to 2580 teragrams (Tg, dry matter) of burnt biomass (Ito and Penner, 2003).

Multi-annual, very broad geographical scale analyses of fire occurrence are scarce, and rely primarily on active fires data. Dwyer et al. (2000) and Stroppiana et al. (2000) analysed 21 months of global, daily daytime imagery from the Advanced Very High Resolution Radiometer (AVHRR) at 1 km spatial resolution, from April 1992 to December 1993. Arino and Rosaz (1999) and Arino and Plummer (2001) described the European Space Agency (ESA) World Fire Atlas (WFA), which is being produced using global daily night time data from the Along Track Scanning Radiometer (ATSR-2) at 1 km spatial resolution. Giglio et al. (2003) used data from the Tropical Rainfall Measuring Mission (TRMM) Visible and Infrared Scanner (VIRS), to map pan-tropical (40° N to 40° S) fire activity between January 1998 and August 2004. Other studies have analysed fire activity over smaller areas and shorter time periods, for example in support of field research campaigns (Olson et al., 1999; Pereira et al., 1999; Anyamba et al., 2003) or to document exceptional fire events (Malingreau et al., 1985; Gutman et al., 2000; Wooster and Strub, 2002).

Active fires detected by satellite provide a good indication of the spatio-temporal patterns of global fire incidence, but are inadequate to estimate biomass burning, due to areal and temporal sampling problems (Pereira et al., 1999a; Dwyer et al., 2000). Nevertheless, active fire data sets have been found useful by atmospheric chemistry researchers, to improve characterisation of the interannual variability and seasonality of emissions, and to assess the effects of biomass burning on the distribution dynamics of aerosols and trace gases. The ESA WFA has been extensively used for these

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**Fig. 1.** Hierarchical arrangement of the WFA data classes used in the study.

purposes, in spite of the limitations described by Arino and Plummer (2001). Table 1 lists articles that used ESA's WFA data, mentioning the study area, the analysis time frame, and the main topic of the research.

A careful and thorough visual analysis of the WFA product in various regions of the world, namely in deserts and sparsely vegetated areas, suggested that the product contained a relatively large number of observations that did not correspond to vegetation fires. The purpose of the present work was to remove those observations from the WFA and provide the global change research community with an improved multi-annual, global fire activity dataset. Some of authors listed in Table 1 attempted screening of the WFA to remove non-vegetation fire data (for example, Generoso et al., 2003; Hoelzemann et al., 2003; Pereira, 2003; Pereira et al., 2004; Schultz, 2002), but less thoroughly than in the present study, and for shorter periods of time.

Throughout the paper we use the following terminology (Fig. 1): observation or count is the more generic designation and refers to each and every WFA element. False alarm designates observations that do not correspond to fires. They can be data acquisition/processing errors or hot ground surfaces. Fires are observations that display a high temperature resulting from energy generated by a combustion process. They include vegetation fires, gas flares and volcanic eruptions. The latter two are jointly designated non-vegetation fires. Our goal is to classify and remove from the WFA dataset all observations other than vegetation fires.

## 2 Data and methods

### 2.1 The World Fire Atlas

The ATSR-2 is a low spatial resolution sensor for environmental monitoring, carried onboard the Second European Remote Sensing Satellite (ERS-2). It has four visible and mid-infrared channels centred at  $0.55\ \mu\text{m}$ ,  $0.67\ \mu\text{m}$ ,  $0.87\ \mu\text{m}$  and  $1.6\ \mu\text{m}$ , and three thermal-infrared channels centred at

$3.7\ \mu\text{m}$ ,  $11.0\ \mu\text{m}$  and  $12.0\ \mu\text{m}$ . The spatial resolution of the ATSR-2 is 1 km at nadir. A swath width of 512 km allows a revisiting period of 3 days at the equator. (Arino and Plummer, 2001). Additional information about the ATSR can be found at <http://www.atrs.rl.ac.uk/documentation/docs/userguide/index.shtml>.

The WFA (<http://dup.esrin.esa.int/ionia/wfa/index.asp>) is built using data acquired at night by the ATSR-2 nadir view camera. WFA data are available from November 1995 to July 2005, with a gap between January and June 1996. We restricted our analysis to the six full years of ATSR-2 data, from January 1997 to December 2002. After this period WFA data are obtained with the Advanced Along-Track Scanning Radiometer (AATSR), onboard the Environment Satellite (ENVISAT). We do not analyse AATSR data in this study.

Interannual variability of vegetation fires at the global scale is large (Duncan et al., 2003a), and is strongly influenced by climatic conditions (Holmgren et al., 2001; Hashimoto et al., 2004). Our six-year analysis encompasses a strong warm phase of the El Niño Southern Oscillation (ENSO) during 1997–1998, a cold phase from late 1998 through 2001, and another warm phase during the second half of 2002, according to the National Oceanic and Atmospheric Administration (NOAA) National Weather Service/Climate Prediction Center ([http://www.cpc.ncep.noaa.gov/products/analysis\\_monitoring/ensostuff/ensoyears.shtml](http://www.cpc.ncep.noaa.gov/products/analysis_monitoring/ensostuff/ensoyears.shtml)). Thus, it ought to adequately characterise fire interannual variability, at least to the extent that it is affected by this global scale climatic phenomenon.

The detection of observations for the WFA is based only on the  $3.7\ \mu\text{m}$  channel, which is highly sensitive to radiation emitted at temperatures from 500 K to 1000 K. Use of night-time data is meant to minimise false alarms due to sun-glint, reflection off cloud edges, and bright soil surfaces. It is also expected to reduce false alarms caused by hot ground surfaces. The detection capability of the  $3.7\ \mu\text{m}$  channel ranges

**Table 1.** Articles that used World Fire Atlas data.

Article	Study area	Time frame	Topic
Balis et al. (2003)	Northern Greece	Summer 2001	Aerosols
Beirle et al. (2004)	Central Australia	1999–2001	NO <sub>x</sub>
Brooks and Legrand (2000)	Northern hemisphere Africa	1984–1993	Aerosols
Bruzzone et al. (2003)	Africa, Australia, Mexico, and Brazil	1996–1999	NO <sub>2</sub>
Chandra et al. (2002)	Africa, Brazil, and Indonesia	1979–2000	O <sub>3</sub>
Chin et al. (2002)	Global	1990, 1996, 1997	Aerosols
Clerbaux et al. (2001)	Global	June 1997	CO
Davison et al. (2004)	Indonesia	Aug–Nov 1997	Aerosols
Duncan et al. (2003a)	Global	1979–2000	CO
Duncan et al. (2003b)	SE Asia	Sep–Nov 1997	CO, O <sub>3</sub>
Edwards et al. (2003)	Africa, Atlantic Ocean	Jan 2001	O <sub>3</sub>
Formenti et al. (2002)	South Africa	1998–1999	Aerosols
Generoso et al. (2003)	Global	1997–2001	Aerosols
Goloub and Arino (2000)	Africa, America, Asia	1996–1997	Aerosols
Gumbricht et al. (2002)	Botswana	1999–2000	Peat fire detection
Hoelzemann et al. (2004)	Global	2000	40+ chemical species, and aerosols
Jenkins et al. (1997)	Africa, Atlantic and Indian Oceans	Not provided	O <sub>3</sub>
Jenkins and Ryu (2003)	Atlantic ocean, W. Africa, S. America	1979–2000	O <sub>3</sub>
Jenkins and Ryu (2004)	Tropical Atlantic, Africa, S. America	1998–2001	O <sub>3</sub>
Kasischke et al. (2003)	Alaska, Canada, Russia	1997–2002	Fire counts
Kelha et al. (2003)	Scandinavia, W. Russia	1999–2000	Fire counts
Kim et al. (2001)	Pantropical	1998–1999	O <sub>3</sub>
Ladstätter-Weissenmayer et al. (2004)	Tropical Pacific ocean	Sep 1999	O <sub>3</sub>
Langmann and Heil (2004)	Indonesia	1997–1998	Aerosols
Legg and Laumonier (1999)	Indonesia	Aug–Sep 1997	Burned area
Martin et al. (2002a)	Global	July 1996	NO <sub>2</sub>
Martin et al. (2002b)	Global	1996–1997	O <sub>3</sub>
Newchurch et al. (2001)	Global	1978–1999	O <sub>3</sub>
Pereira (2003)	Tropical savannas	–	Burned area
Pereira et al. (2004)	Southern Africa	–	Burned area
Pinty et al. (2000)	Africa	1996	Albedo change
Pochanart et al. (2003)	Thailand	1997–2000	CO
Richter and Burrows (2002)	Africa	1997	NO <sub>2</sub>
Rödenbeck et al. (2003)	Global	1982–2000	CO <sub>2</sub>
Sauvage et al. (2004)	Equatorial Africa	1997–2003	O <sub>3</sub>
Schultz (2002)	Global	1996–2000	CO
Silva et al. (2003)	Southern Africa	2000	Burned area
Spichtinger et al. (2004)	Panboreal	1997–1998	CO
Staudt et al. (2001)	Pacific Ocean	March–April 1999	CO
Sudo et al. (2002)	Global	1988–1999	Multiple chemical species
van der Werf et al. (2003)	Global	1998–2001	C
van der Werf et al. (2004)	Global	1997–2001	CO <sub>2</sub> , CO, CH <sub>4</sub>
Wooster and Strub (2002)	Indonesia	1997	Burned area
Yurganov et al. (2004)	Northern Hemisphere	1996–2001	CO
Zhao et al. (2000)	Northern Japan	1995–1997	HCN
Zhao et al. (2002)	Northern Japan	1995–2000	CO, C <sub>2</sub> H <sub>6</sub> , C <sub>2</sub> H <sub>2</sub> , HCN

from a burning area of 0.1 ha at 600 K to 0.01 ha at 800 K (<http://dup.esrin.esa.int/ionia/wfa/algorithm.asp>). Wooster and Rothery (2002) calculated a sensor saturation envelope for observations of sub-pixel sized hotspots at 3.7  $\mu\text{m}$ , as a function of hotspot temperature ( $^{\circ}\text{C}$ ) and hotspot size ( $\text{m}^2$ ).

Two versions of the WFA are provided by ESA. The first includes all pixels with brightness temperature at 3.7  $\mu\text{m}$

larger than 312 K (saturation temperature), and the second sets the threshold at 308 K. In this study we used only the dataset created with the 308° K threshold, designated algorithm 2. Underestimation of fire activity, considered the main limitation of the product (Kasischke et al., 2003), is expected to be less severe with this threshold. The trade off is a higher number of false alarms (Arino and Plummer, 2001).

**Table 2.** Annual results of WFA screening.

Year	Original	Screened	%Screened	Vegetation Fires	%Vegetation Fires
1997	164 221	33 878	20.63	130 343	79.37
1998	238 137	66 397	27.88	171 740	72.12
1999	155 718	39 461	25.34	16 257	74.66
2000	150 416	39 790	26.45	110 626	73.55
2001	141 215	35 460	25.11	105 755	74.89
2002	176 909	38 868	21.97	138 041	78.03
Mean	171 103	42 309	24.56	128 794	75.44

Single-channel (with the AVHRR channel 3, at  $3.75\ \mu\text{m}$ ) algorithms for active fire detection were used before, namely by Muirhead and Cracknell (1985), Malingreau and Tucker (1988), Setzer and Pereira (1991), and Pereira and Setzer (1993). Martín et al. (1999) and Li et al. (2001) reviewed limitations of this approach and discussed alternative algorithms.

Between January 1997 and December 2002 there are some periods with missing (not a single 512 km by 512 km data frame available) or incomplete data (a variable number of 512 km by 512 km data frames not available). The year 2000 has 14 days with missing data. In 2001 there are 16 days of incomplete data and 25 days with missing data. In 2002 there are 15 days of incomplete data and 12 days with missing data. Above 60 degrees latitude north, data are missing from February to August 1997, due to processing problems. The various modes of operation of ERS-2 in 2001 affected significantly the geo-location accuracy of the ATSR data, mainly due to yaw mispointing in the satellite gyro-less mode (<http://dup.esrin.esa.int/ionia/wfa/2001-ESA02-index.asp>). The average magnitude of the location accuracy errors varied from 10 km between February and May 2001, down to 2–3 km from June 2001 onwards. Arino and Plummer (2001) discussed WFA limitations, identified during an extensive international product assessment. The main limitation of the WFA, for both temperature thresholds in channel 3, is underestimation of actual fire activity. This problem is less severe for algorithm 2. Omission errors are attributed mainly to the timing of image acquisition, the instrument revisit time, the spatial resolution of the ATSR, and the thermal thresholds selected. Fire activity tends to peak during the afternoon, both for wildfires and for prescribed burns. Thus, the night time ATSR overpass samples a moment of reduced activity in the diurnal fire cycle. The revisit time of the ATSR at the equator is three days, meaning that many short duration fires are not observed. Biome specific differences in fire persistence are likely to introduce a bias in favour of the detection of forest fires, to the detriment of shorter duration savanna fires (Giglio et al., 2006). The spatial resolution of 1 km also limits the ability of the ATSR to detect many small fires, to

an extent that is dependent on fire intensity. This limitation is shared by other sensors, such as the AVHRR and MODerate resolution Imaging Spectrometer (MODIS), and is more severe in coarser resolution instruments, such as the Geostationary Operational Environmental Satellite (GOES). The thermal thresholds of algorithms 1 and 2 were designed to achieve an acceptable trade off between omission and commission errors. They may be too restrictive to capture active fires that affect only a small fraction of the area of a pixel. Underestimation of fire activity at high latitudes during the boreal summer was first described by Arino and Plummer (2001) and confirmed by Kasischke et al. (2003). Arino and Plummer (2001) considered commission errors to be less of a problem in the WFA than omission errors. They were attributed primarily to urban lights and oil and gas flares. Commission errors due to hot ground surfaces in deserts and sparsely vegetated areas were mentioned only for the algorithm 2 product. Overall, Arino and Plummer (2001) considered the main advantages of the WFA to be the low level of commission errors, and the adequate spatial distribution and location accuracy of the hotspots.

## 2.2 Screening procedure

The screening, or filtering, of false alarms and non-vegetation fires from among the set of observations included in the WFA was implemented in two stages. In the first stage, a series of spatial masks were used to classify false alarms and non-vegetation fires generated by specific types of land cover, gas flares, and volcanic activity. In the second stage, the WFA data were visually analysed, to classify erroneous observations not detected in the first stage. This two-stage classification of WFA observations is exhaustive, i.e. it addresses each and every count in WFA, but it is not mutually exclusive, i.e., a given observation may be captured by more than one filter. This may not be the ideal classification structure, but it was impossible to construct a priori a strict partition of the data. With the procedure followed, the number of observations allocated to each filter is independent from the order in which the filters were actually applied to the data. The screening procedure required the use of ancillary

datasets, namely a land cover map, a stable lights map, and volcanic activity location data.

### 2.3 Screening based on land cover

Two global land cover products are contemporary with the WFA data, and thus are potentially appropriate for screening non-vegetation fire counts. These products are the Global Land Cover (GLC) 2000 map (Fritz et al., 2003), and the MODIS MOD12 Land Cover map (Strahler et al., 1999; Friedl et al., 2002). The accuracy of the MODIS land cover map is  $71.6 \pm 0.25\%$ . Accuracy assessment for the GLC 2000 map is still in progress, but preliminary results indicate an accuracy level comparable to that of the MODIS product. Giri et al. (2005) provide a detailed comparison of these two land cover maps. The GLC2000 map ([www-gvm.jrc.it/glc2000](http://www-gvm.jrc.it/glc2000)) is based on SPOT-VEGETATION satellite imagery acquired during the year 2000, at a spatial resolution of 1 km. The map distinguishes 22 land cover classes. The MOD12 Land Cover map also has a spatial resolution of 1 km, and is based on 12 months of data acquired between 15 October 2000 and 15 October 2001. It uses the International Geosphere-Biosphere Programme (IGBP) 17-class global vegetation classification scheme. The legend of the GLC 2000 map was considered more adequate for the purposes of the present study. It separates bare (incombustible) land from sparsely vegetated (potentially combustible) land, while the MOD12 IGBP legend has a “barren and sparsely vegetated class”, which is ambiguous from the standpoint of potential combustibility. The GLC 2000 land cover classes bare areas ( $24\,629\,888\text{ km}^2$ ), natural and artificial water bodies ( $471\,061\,857\text{ km}^2$ ), snow and ice ( $10\,660\,085\text{ km}^2$ ), and artificial surfaces and associated areas ( $3\,217\,319\text{ km}^2$ ) were considered incapable of supporting vegetation fires. Therefore, all WFA observations falling on these land cover classes were classified as false alarms or non-vegetation fires. Visual inspection of the data also revealed the presence of numerous counts in peri-urban industrial areas, primarily in Europe, North America, and Asia. Screening of these observations, not eliminated by the GLC 2000 artificial surfaces and associated areas, was accomplished with a spatial mask including all areas that were lighted in over 25% of the cloud-free observations in the Elvidge et al. (2001) human settlements layer.

### 2.4 Screening non-vegetation fires

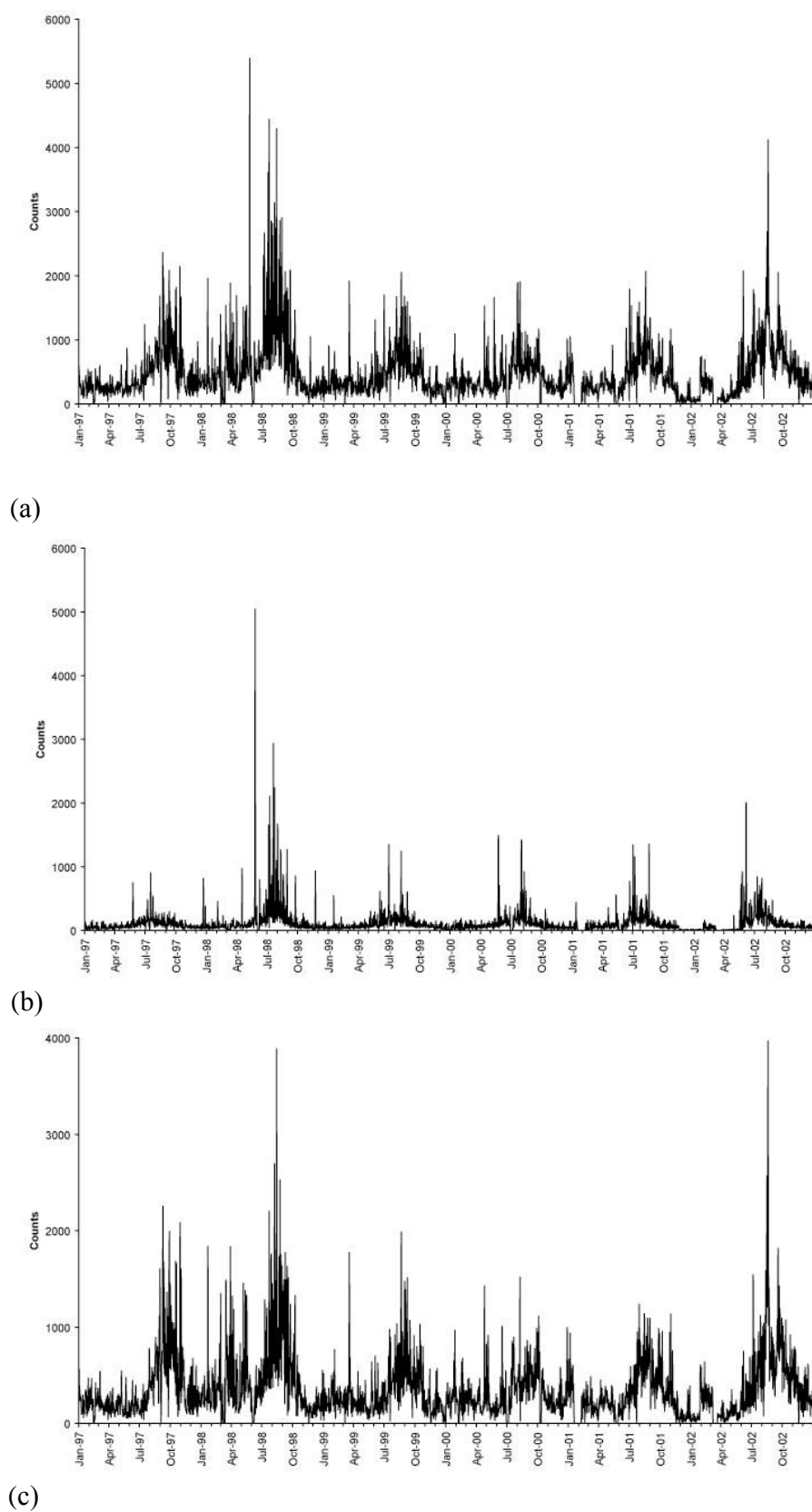
The screening of observations corresponding to gas flares relied on data from the Defense Meteorological Satellite Program (DMSP) Operational Linescan System (OLS) Night time Lights of the World data product [http://www.ngdc.noaa.gov/dmsp/download\\_world\\_change\\_pair.html](http://www.ngdc.noaa.gov/dmsp/download_world_change_pair.html). This product includes a gas flares layer for the year 2000, which contains mean OLS visible band digital numbers, from cloud-free observations. Gas flares are a subset of stable lights, defined as those lights visible in at least 10% of cloud-free obser-

vations. Gas flares are identified in the stable lights dataset based on their large circular appearance and lack of coincidence with populated places (Elvidge et al., 2001). The gas flares mask covers an area of  $887\,007\text{ km}^2$ . The WFA also contains counts generated by volcanoes. Elimination of these observations was based on volcanic activity timing and location data from the Global Volcanism Program (GVP) of the Smithsonian Institution <http://www.volcano.si.edu/>, from Volcano World <http://volcano.und.edu/> and from the Hawaii Institute of Geophysics and Planetology (HIGP) MODVOLC WWW page <http://modis.higp.hawaii.edu/>.

Detailed reports available from these sources describing aspects of eruptions relevant for determining the nature of WFA observations, such as the extent and direction of lava flows, were used when deemed necessary. According to the GVP, 119 volcanoes were active globally between 1997 and 2002. The geographical coordinates of all 119 volcanoes were plotted together with the WFA data, and the dates of all WFA counts within a 10 km radius buffer around the volcano location were compared against dates of reported volcanic activity. The GLC2000 land cover map and Landsat scene bands 5-4-3 color composite quick-looks, with a nominal spatial resolution of 240 m–480 m (United States Geological Survey (USGS) Global Visualization Viewer, <http://glovis.usgs.gov/>) were often used, to determine if the counts might be vegetation fires, possibly ignited as a result of volcanic eruptions. Observations that coincided with periods of volcanic activity, and did not appear to occur over vegetated areas were classified as non-vegetation fires.

### 2.5 Additional data screening

Preliminary visual inspection of the WFA data revealed the presence of large clusters of observations unlikely to correspond to vegetation fires. Some of the clusters exhibited regular geometric shapes, such as triangles and lines. These very conspicuous geometric clusters of observations were visually identified and labeled false alarms caused by image acquisition/processing errors. Other clusters contained very large numbers of observations, concentrated in very short periods of time, over sparsely vegetated areas that typically exhibited almost no fire activity. Identification of anomalous space-time data clusters was accomplished with exploratory spatial and temporal data analysis. The difference between daily observation counts and five-day moving means helped identify exceptional temporal clusters in a time-series of the full study period. Global counts maps were then generated for the periods of anomalous time clustering. The location of spatial clusters occurring during these periods was highlighted using kernel density estimation, a spatial interpolation technique appropriate for individual point locations (Bailey and Gatrell, 1995). The likelihood of each space-time cluster of observations actually representing vegetation fires was assessed via visual inspection of contemporary Advanced Very High Resolution Radiometer (AVHRR)



**Fig. 2.** Daily time-series of original WFA observations (a), data removed from the WFA (b), and screened data set (c).

**Table 3.** Number of observations captured by each filter. An observation may have been captured by more than one filter.

Year	Land cover				Gas flares	Volcanoes	Acq/proc <sup>1</sup>	S-T clusters <sup>2</sup>	Total
	Bare	Water	Artificial	Snow & Ice					
1997	11 334	10 305	5721	119	17 258	868	1293	2816	49 714
1998	25 605	12 146	6883	139	21 384	1205	1685	22 973	92 020
1999	14 686	10 173	6195	3	19 250	846	184	5752	57 089
2000	11 306	9220	5882	11	20 079	1350	1227	8163	57 238
2001	11 754	8723	4094	80	15 639	1181	378	7757	49 606
2002	16 190	8595	4635	56	13 153	1297	1166	13 622	58 714
Total	90 875	59 162	33 410	408	106 763	6747	5933	61 083	364 381

<sup>1</sup> Data acquisition and processing errors.<sup>2</sup> Space-time clusters.<sup>3</sup> The grand total exceeds the number of screened observations due to counting by more than one filter.

satellite imagery, at 1 km<sup>2</sup> spatial resolution, and/or Landsat scene quick-looks. The AVHRR imagery was obtained from the National Oceanic and Atmospheric Administration/National Environmental Satellite, Data and Information Service (NOAA/NESDIS) Comprehensive Large Array-data Stewardship System (CLASS), (<http://www.class.noaa.gov/nsaa/products/welcome>).

### 3 Results

#### 3.1 Temporal analysis

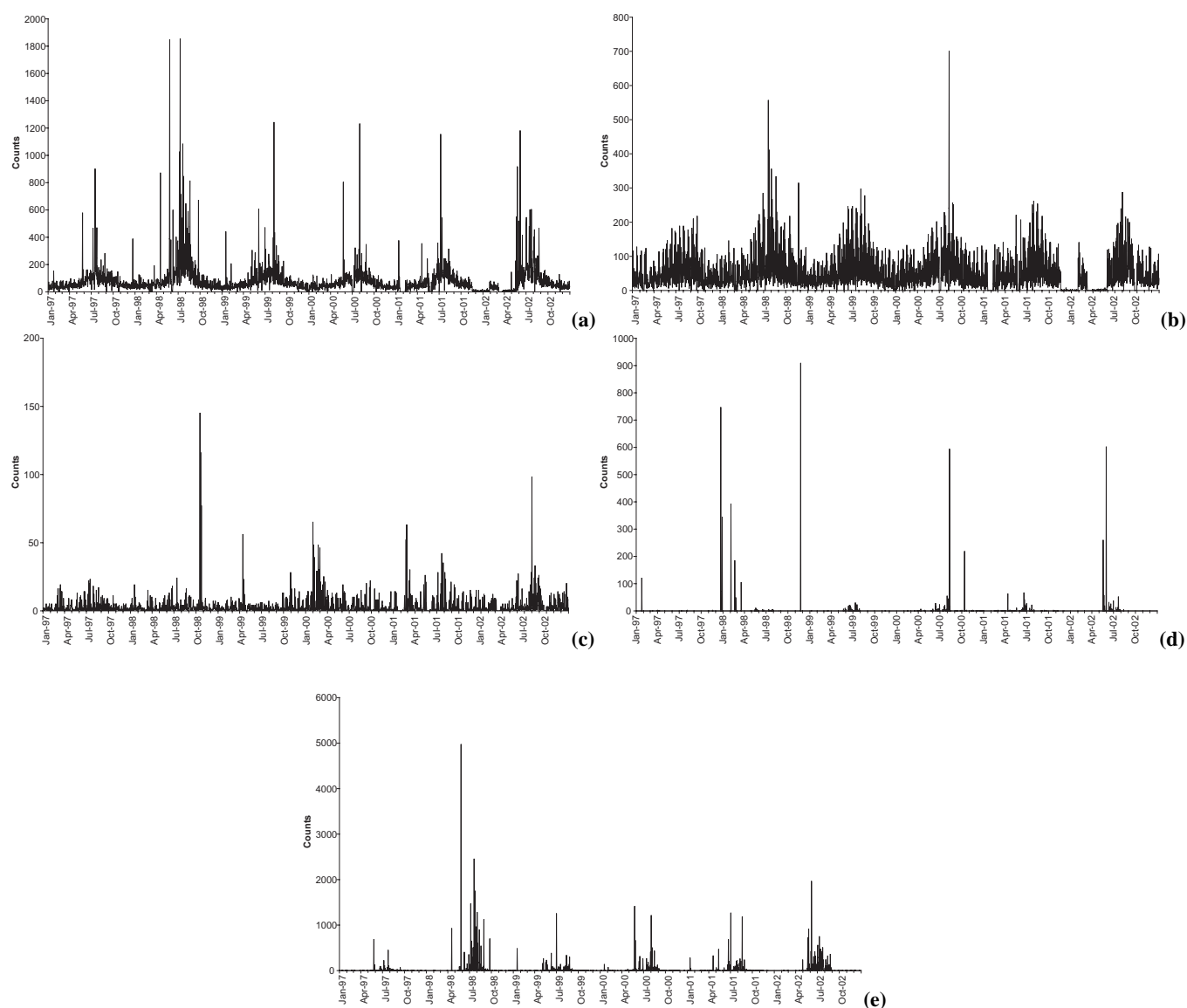
The original WFA dataset contained 1 026 616 observations, of which 772 762 (75.27%) were considered to actually represent vegetation fires, while 253 854 (24.73%) correspond to false alarms and non-vegetation fires. The annual proportion of screened observations varied between 21% and 28%. Table 2 summarizes the results of the WFA screening process, with results displayed per year. Figure 2 shows the daily resolution time-series of the original WFA data set (Fig. 2a), the time series of false alarms and non-vegetation fires removed from the WFA (Fig. 2b), and the time series of the screened dataset, containing only vegetation fires (Fig. 2c). The time-series in Fig. 2a reveals markedly seasonal patterns, with larger numbers of observations detected during the boreal summer, approximately between July and October, and peaking in August–September. In 1997 the peak fire activity occurred later, during the month of October. The year with the most counts was 1998, when very high numbers were detected between April and October. The time-series of non-vegetation fires and false alarms removed from the WFA (Fig. 2b) also exhibits a seasonal pattern, similar to that of the original data set. Most of the days with very large (>1000) number of counts screened occur between June and September 1998. Smaller data spikes in other years also occur during the boreal summer. The screened WFA time-series (Fig. 2c) has fewer spikes and relatively to the original data

set, the seasonal component displays lower amplitude, while the phase does not appear to have shifted. The anomalously low numbers of observations recorded in January, February and December 2001, and in February and March 2002 correspond to periods of missing or incomplete data, as indicated in the WFA World Wide Web (WWW) page. Figures 3a–e disaggregate the time-series of false alarms and non-vegetation fires into those of the various filters applied to the data. Note the scale variations in the different figures. The observations screened with the land cover filter and with the gas flares filter (Figs. 3a–b) show a continuous distribution and a clearly seasonal trend, with more observations during the boreal summer. In the case of the land cover filter, this seasonality is induced by hot land surfaces in the larger land expanses of the northern hemisphere. The seasonality in the counts screened with the gas flares filter results from an overlap with the land cover filter and with space-time clusters, as shown in Table 3. The seasonal trend is believed to be induced mostly by hot land surfaces, and ought not be inherent in the gas flares activity. Since our purpose is not to engage in a detailed analysis of the various types of observations included in the WFA, but only to eliminate those that do not correspond to vegetation fires, we did not attempt to remove the overlap between observations captured with the land cover and gas flares filters. Observations screened with the volcanoes filter (Fig. 3c) also occur continuously but with a very low background level, and exhibit sporadic spikes corresponding to large eruptions. The acquisition/processing false alarms (Fig. 3d) occur sporadically. Finally, the space-time hot surfaces clusters (Fig. 3e) display a discontinuous but markedly seasonal pattern, occurring only during the boreal summer.

#### 3.2 Geographical and quantitative analysis

Figure 4 shows the location of space-time clusters of observations, acquisition/processing errors, and counts due to volcanic activity. All acquisition/processing errors are



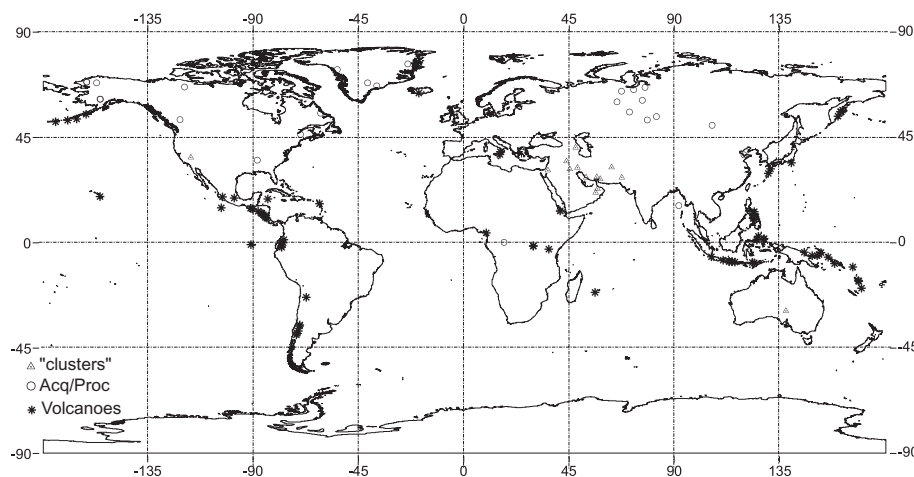


**Fig. 3.** Daily time series of observations removed from the WFA using various filters: land cover (a), oil and gas flares (b), volcanoes (c), data acquisition/processing errors (d), and anomalous space-time clusters (e).

**Table 4.** Number of observations captured by various filter intersections.

Year	$LC \cap FI$	$LC \cap Vol$	$FI \cap Vol$	$LC \cap FI \cap Vol$	$Clu \cap LC$	$Clu \cap FI$	$LC \cap A/P$
1997	11 808	525	0	0	1829	84	524
1998	13 739	457	281	77	8558	836	15
1999	12 659	433	0	0	2851	441	16
2000	12 299	374	192	19	2880	443	60
2001	9724	539	125	19	2624	463	83
2002	8534	541	218	57	8690	101	704
Total	68 763	2869	816	172	27 432	2368	1402

<sup>1</sup> LC: land cover; FI: gas flares; Vol: volcanoes; Clu: space-time clusters; A/P: acquisition/processing;  $\cap$  is the set intersection symbol.



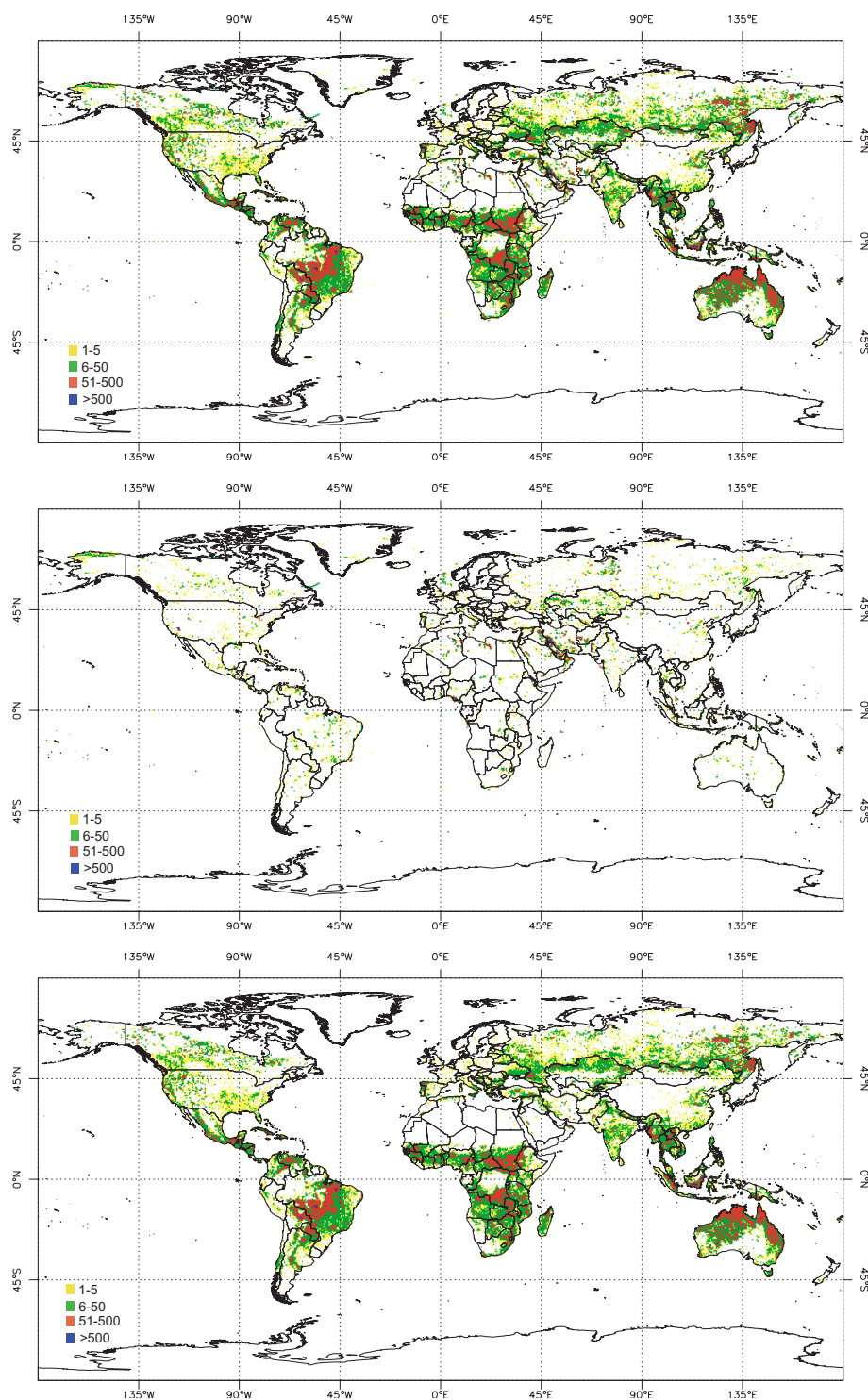
**Fig. 4.** Location of the major anomalous space-time clusters of observations, of data acquisition/processing errors, and of observations resulting from volcanic activity.

located in the northern hemisphere, at relatively high latitudes. The space-time clusters of observations occur at lower latitudes, mostly in tropical and sub-tropical areas. No acquisition/processing errors, or space-time clusters are found in Africa or South America. Most counts of these three kinds occur in North America and Eurasia. Figures 5a–c display maps of the original WFA data set, the screened false alarms and non-vegetation fires, and the vegetation fires data set, respectively. At the scale used, Figs. 5a and c are very similar, due to the strong spatial clustering of the screened data (Fig. 4b). Figure 5c displays the clusters of genuine fire activity, in southern Mexico, the cerrado savannas of Brazil, the savannas of the northern hemisphere of Africa, Indonesia, and the Siberian Far East. The 1997–1998 El Niño event strongly contributed to all of these concentrations of fire activity, with the possible exception of the African cluster (Nepstad et al., 1999; Siegert and Hoffmann, 2000; Page et al., 2002; Wooster and Strub, 2002; Haugaasen et al., 2003; van der Werf et al., 2004; Soja et al., 2004; Roman-Cuesta et al., 2004).

Figure 6 shows the histogram of counts screened per  $0.5^\circ$  cell, revealing the heavy positive skew of the distribution. In order to emphasize the location of the major observation clusters, the data displayed in Fig. 5b were smoothed to a  $0.5^\circ$  grid cell (Fig. 7), using kernel density estimation (Bailey and Gatrell, 1995) with an adaptive Gaussian kernel encompassing 250 observations. This figure clearly shows the locations of the major clusters of screened observations, in the Death Valley, California, USA, in Algeria and in coastal Nigeria, in the Persian Gulf region, extending east to Pakistan, and in north-central Siberia. Table 3 shows the annual number of observations captured by each filter. The year with the largest number of counts is 1998, mostly due to false alarms. This is to be expected, since those counts are generated by hot ground surfaces and

1998 was the hottest year on record at the global scale, according to the NASA Goddard Institute for Space Studies (<http://data.giss.nasa.gov/gistemp/>). The year 2001 has the lowest number of observations, probably because it is the year with the most days of missing or incomplete data.

The land cover filter captured a total of 183 855 observations, corresponding to 17.91% of the original WFA data. The bare areas class captures the most observations (8.85%), followed by water bodies (5.76%). Observations located over artificial surfaces and associated areas represent 3.3%, while only 0.04% of counts are found in the snow and ice class. Gas flares, volcanoes, acquisition/processing errors, and space-time clusters respectively represent 10.4%, 0.6%, 0.58% and 5.95% of the original number of WFA observations. One-hundred and nineteen volcanoes contained a total of 7145 observations within the 10-km radius buffer. Some of the observations located within the buffer of these volcanoes were considered actual vegetation fires, thus reducing to 6747 the number of observations screened out. In four cases, lava flows expanded beyond the buffer. Those observations were manually screened. The Kilauea, in Hawaii, USA, the Nyamuragira, in the Democratic Republic of Congo, and the Etna, in Italy, generated the most counts (2307, 1004 and 658, respectively). Data acquisition/processing errors were found in northern Alaska, the Bohai Bay in China, central Congo, western Siberia, Greenland, the Russia-Mongolia border area, the Bay of Bengal in the Indian Ocean, the Northwestern Territories, British Columbia and Quebec (Canada), and in the state of Tennessee (USA). The most important ones were those located in western Siberia (2193 counts) and in northern Alaska (917 counts). Corrupted satellite telemetry is a possible explanation for this kind of WFA counts. Figure 8 displays examples of data acquisition/processing errors.



**Fig. 5.** Global maps (1997–2002) of original WFA fire counts (a), data removed from the WFA (b), and screened data set (c).

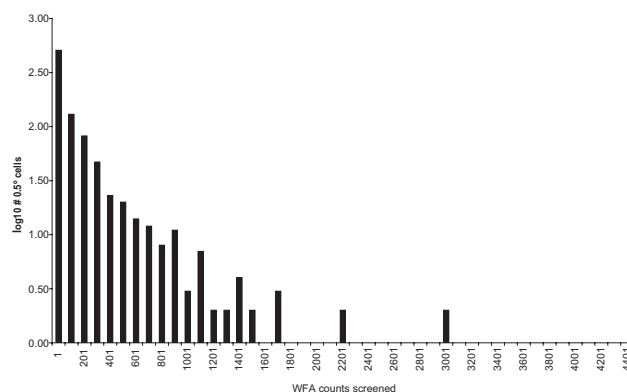
Space-time observation clusters were all located in bare or sparsely vegetated surfaces of hot, arid regions, namely: Lake Eyre (Southern Australia), the Denakil depression (Ethiopia/Eritrea), the Zagros mountains foothills (Iran),

the Dead Sea (Israel), Death Valley (California, USA), the Kirthar range foothills (Pakistan), and southern Afghanistan. The most important ones are those in the Zagros foothills (12 898 counts) and the Kirthar foothills (9854 counts).

Table 4 displays the number of counts for the major filter intersections, i.e. numbers of observations that were captured by more than one filter. The filter intersections that capture the most observations are the one between land cover and gas flares, and the one between land cover and space-time clusters. The majority of gas and oil exploration sites are located either offshore or in desert areas. Thus, they intersect extensively with the water bodies and bare areas classes of the land cover mask. Space-time clusters typically occur on hot ground surfaces, and therefore predominate over the bare areas land cover class. Again, the year 1998 displays the largest and 2001 the lowest number of screened observations, for the reasons already mentioned.

#### 4 Discussion and conclusions

The WFA algorithm 2 data set contains a large number of observations that are not vegetation fires, in spite of having been built using only night time data. Commission errors, generated by a variety of causes, including hot ground surfaces, gas flares, volcanoes, and image acquisition/processing problems, represent almost one-quarter of all observations. We used a combination of geographical masks and visual data inspection to classify and subsequently remove these non-vegetation fires and false alarms from the dataset. The most time consuming step of the screening procedure was the identification of anomalous space-time clusters of observations in areas that can carry fire, but where it is unlikely to occur massively in very short periods of time. WFA screening based only on geographical masks would eliminate most of the unwanted data and is relatively easy to implement. However, non-negligible errors would remain, located mostly in the Middle East and occurring during the boreal summer. Commission errors found are not randomly distributed but, on the contrary, are highly clustered in space and in time. Such clustering reflects, to some extent, the screening procedures employed. By design, the gas flare screening, the night time lights screening, the volcano screening, and the visual/statistical cluster screening identify commission errors that are clustered in space and time. Any practical data screening procedure for a dataset of this size can only be expected to remove the relatively more obvious false alarms and non-vegetation fires. Scattered, individual erroneous observations are very likely to escape the screening procedures employed, except for those eliminated by the land cover mask. Nevertheless, we believe that the clustered, relatively obvious false alarms and non-vegetation fires represent the majority of errors, especially the more persistent ones, and thus the filtered data set is considered a substantial improvement over the original, unfiltered WFA. Accuracy of the screening procedure is expected to be lower during the periods of more imprecise data location, especially during the first semester of 2001, and mostly near the edges of the various spatial masks



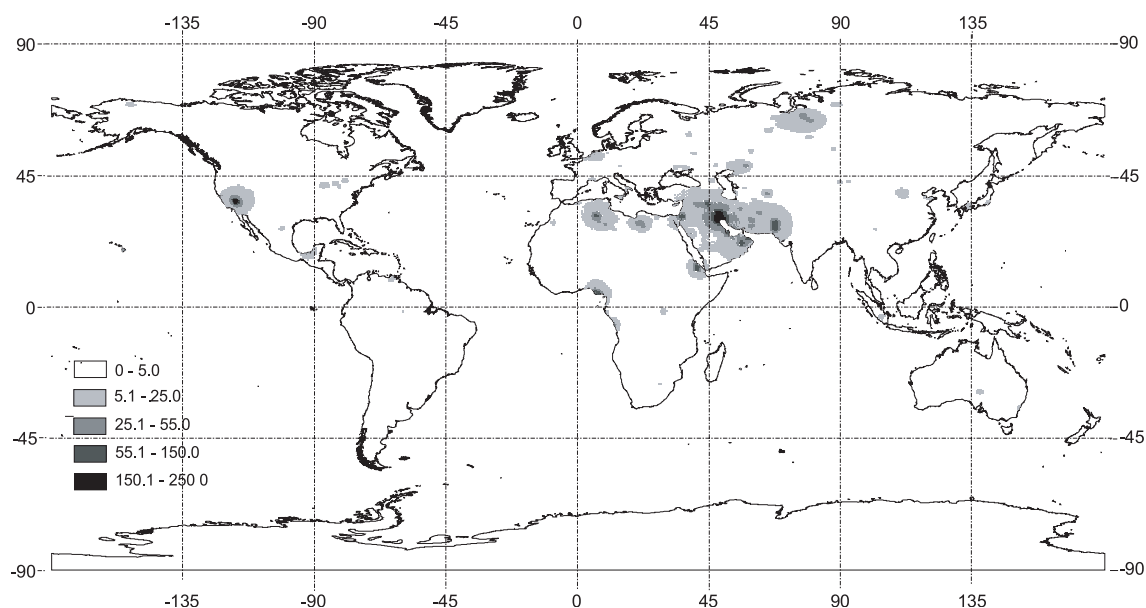
**Fig. 6.** Statistical distribution of the number of WFA counts removed in each 0.5° grid cell.

used. Screening based on visual and statistical cluster detection procedures ought to remain essentially unaffected.

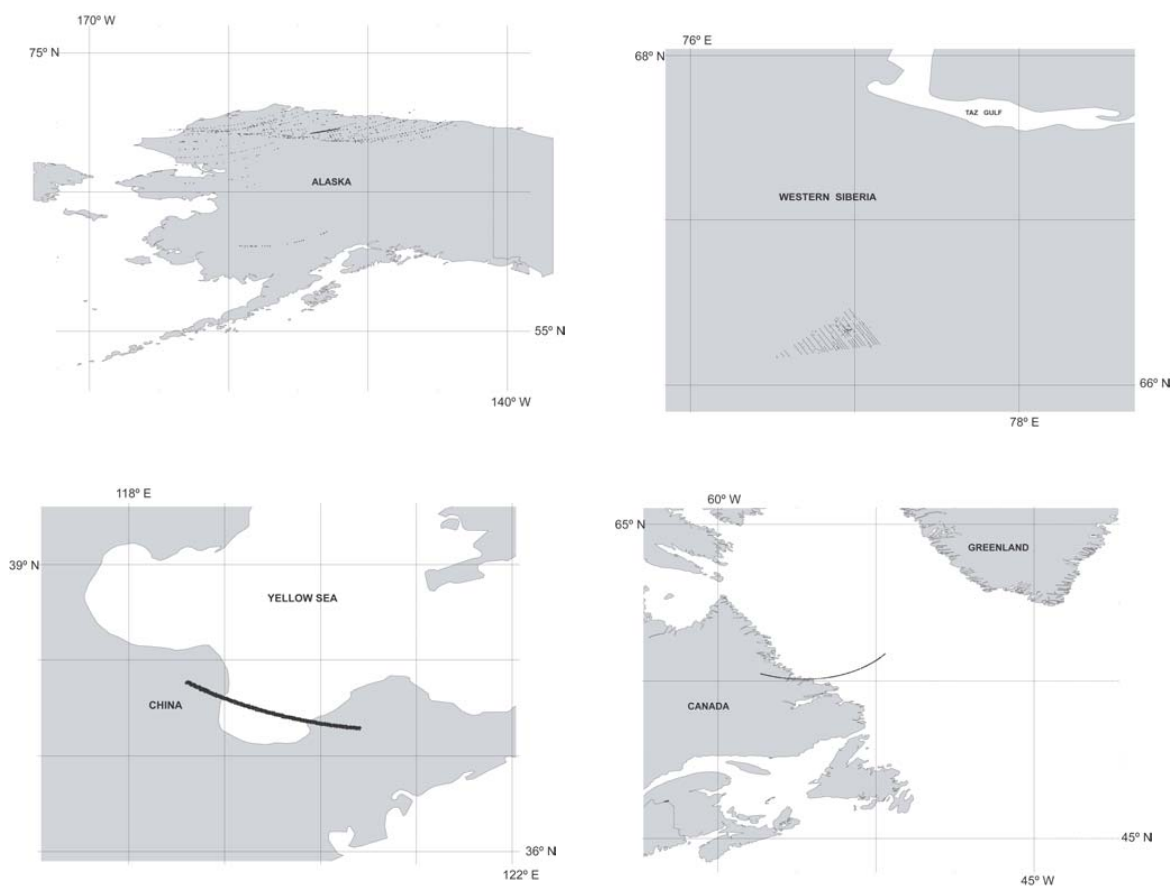
The temporal structure of errors may affect the characterization of vegetation fire seasonality, but appears to have a larger impact upon estimates of inter-annual variability. The spatial pattern of errors may affect estimates of the magnitude and geographical distribution of emissions sources, especially in studies that included areas where large clusters of errors were found, and possibly also in the case of global analyses. These effects may have influenced results of research papers that used the original WFA data. The screened dataset provides a better characterisation of global fire geography, seasonality and inter-annual variability. It may contribute to improving the accuracy of emissions inventories based on statistics scaled with fire activity data (Schultz, 2002; Generoso et al., 2003), and also of burned area products derived by combining the spectral signal of fire scars and that of active fires (Fraser et al., 2000; Giglio et al., 2006). Analyses of the relationships between fire and vegetation or land cover will also be more accurate, due to the removal of very large numbers of false alarms located in deserts and sparsely vegetated areas.

As additional WFA data become available, detection of exceptional events may be automated using statistical methods for space-time cluster analysis (Baker, 1996; Kulldorff et al., 1998). In future near-real time active fire monitoring systems, detection of space-time clusters may be implemented on-line, based on surveillance procedures such as those developed by Rogerson (1997, 2001) and Kulldorff (2001).

The screened WFA dataset developed in this study will be available at the REanalysis of the TROpospheric chemical composition over the past 40 years (RETRO) project WWW page (<http://retro.enes.org/datasets.html>). Additional data screening, up to July 2005 is in progress.



**Fig. 7.** Kernel density estimation maps of data removed from the WFA.



**Fig. 8.** Examples of data acquisition/processing errors, located in northern Alaska, western Siberia, northeastern China, and northeastern Canada.

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